

Uncertainty Dispersion Analysis of Atmospheric Re-entry using the Stochastic Liouville Equation

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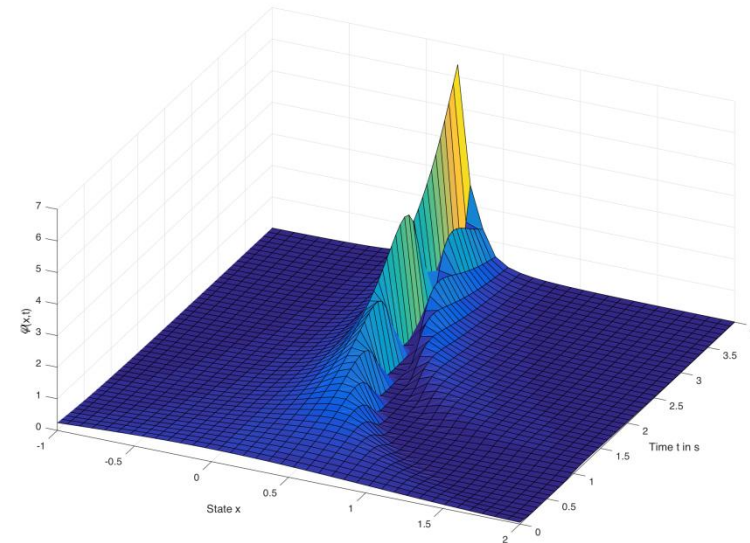
Outline

- Analyzing re-entry onto Earth is subjected to uncertainties
- Prediction of impact zone and its dispersion necessary
- Evolution of uncertainties in the initial conditions throughout the re-entry
- Stochastic Liouville Equation as alternative method for the Monte-Carlo Analysis
- Utilizing probability density functions (PDF)
- Solve PDF transport equation directly
- Comparison of results with reference dispersion generated by operational tool of GSOC (Monte-Carlo)



The Stochastic Liouville Equation

- Examine the development of the probability density of system dynamics over space and time
- Consider uncertainties in states and parameters
- From the resulting probability density function (PDF) all stochastic moments (e.g. covariance) can be deduced
- Non-linear model usable, no linearization needed



The Stochastic Liouville Equation

- Consider a nonlinear state space model as following

$$\dot{X} = F(X), \text{ where } X = (x, p)^T \in \mathbb{R}^{n_x+n_p}$$

- The temporal evolution of probabilistic uncertainty is governed by

$$\frac{\partial \varphi(X, t)}{\partial t} + \sum_{i=1}^{n_x} \frac{\partial}{\partial X_i} [\varphi(X, t) F_i(X)] = 0$$

Stochastic Liouville Equation

- Quasi linear partial differential equation (PDE) depending on the joint PDF



The Stochastic Liouville Equation

- the PDE can be reduced to an ordinary differential equation (ODE)

$$\frac{d\varphi(X, t)}{dt} = -\varphi(X, t) \sum_{i=1}^{n_x} \frac{\partial F_i}{\partial X_i}$$

which yields the solution

$$\varphi(X, t) = \varphi_0 \exp\left(-\int_0^t \sum_{i=1}^{n_x} \frac{\partial F_i}{\partial X_i} dX\right)$$

- with the initial state and parametric uncertainties specified in terms of a joint PDF

$$\varphi_0 = \varphi(X, t_0)$$



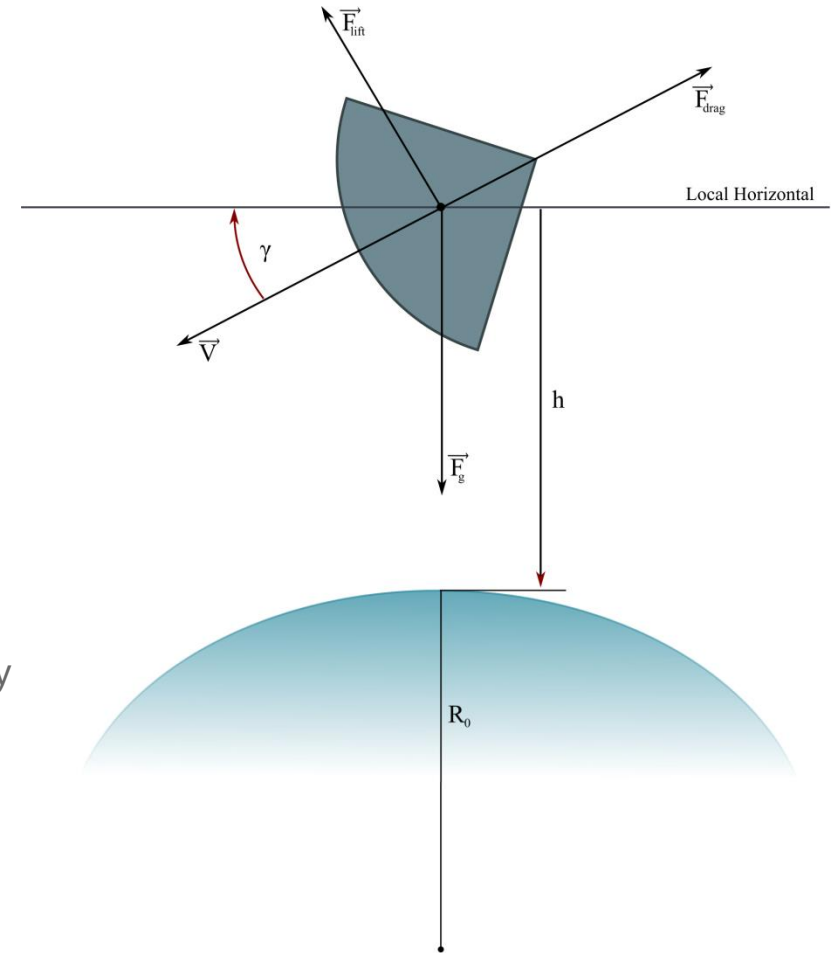
Uncertainty Dispersion of Space Debris Re-Entry

Consider the four state model
in case of non-rotating and spherical Earth

$$\begin{aligned}\dot{h} &= v \sin \gamma \\ \dot{v} &= -\frac{\rho}{2B_c} v^2 - g \sin \gamma \\ \dot{\gamma} &= \frac{\rho}{2B_c} \frac{C_L}{C_D} v + \cos \gamma \left(\frac{v}{R_0 + h} - \frac{g}{v} \right) \\ \dot{\theta} &= \frac{v \cos \gamma}{R_0 + h}\end{aligned}$$

with

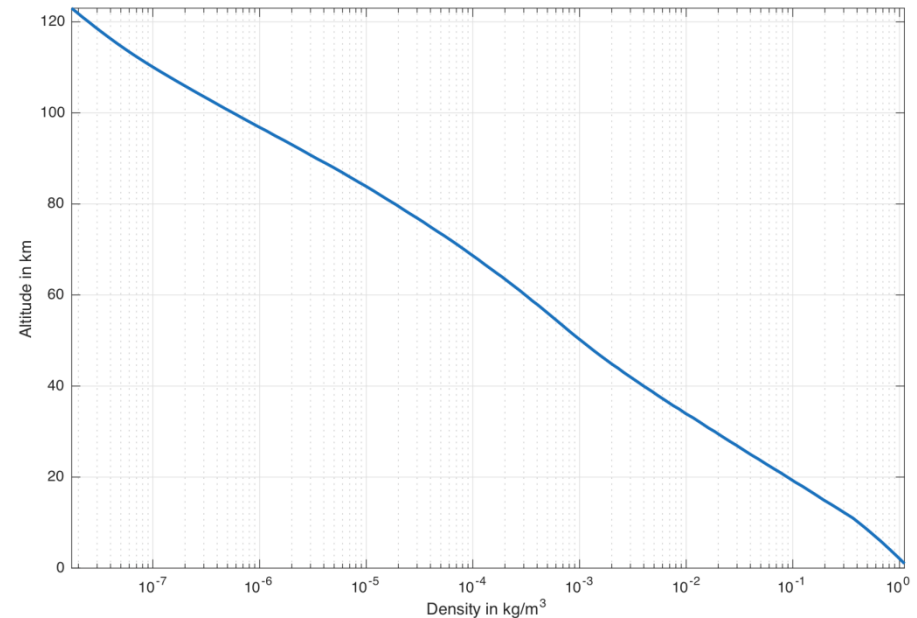
h	Altitude	g	Gravitational field
v	Velocity	ρ	Atmosphere density
γ	Flight Path Angle (FPA)	B_c	Ballistic coefficient
θ	Longitude	$\frac{C_L}{C_D}$	Lift-to-Drag Ratio



Example Re-Entry Trajectory

GSOC Re-entry model

- Gravity model
 - point mass
(degree and order set to zero)
- Sun and moon forces considered
- Atmosphere model
 - Jacchia-Gill ($h \geq 90\text{km}$)
 - US Standard Atmosphere of 1976
(USSA76, $h < 90\text{km}$)
- For the use within the SLE, data of the Jacchia-Gill and USSA76 was interpolated



Example Re-Entry Trajectory

The three state model was extended by the Longitude along track.

$$\dot{\theta} = \frac{v \cos \gamma}{R_0 + h}$$

to determine the dispersion

- S/C parameter:

Mass: 100 kg

C_D: 2.3

C_L: 0.0

Area: 1.0 m²

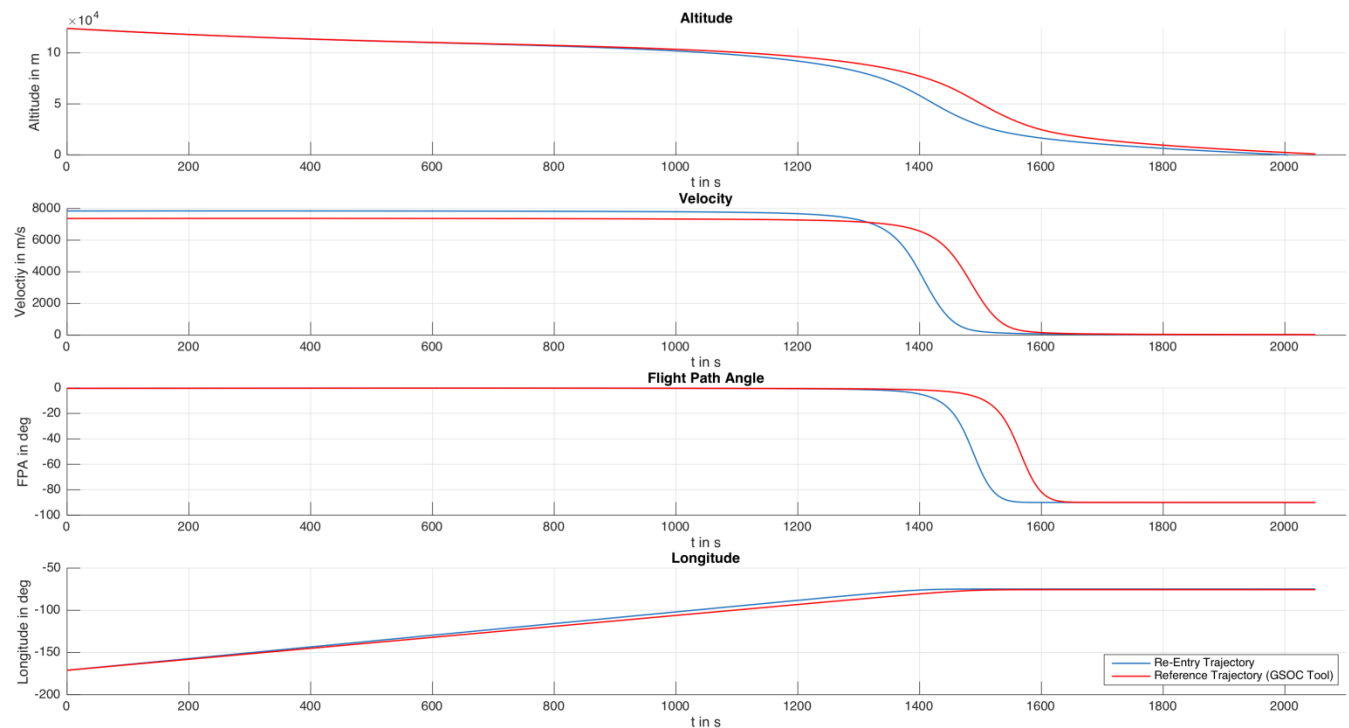
- Initial conditions:

h₀ 123.996 km

v₀ 7.8442 km/s

γ₀ -0.243°

θ₀ -171.11°

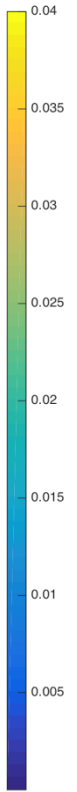
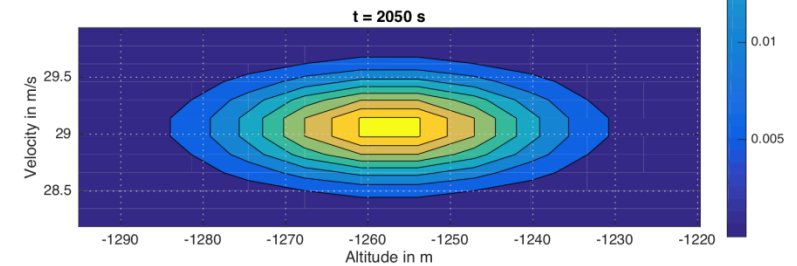
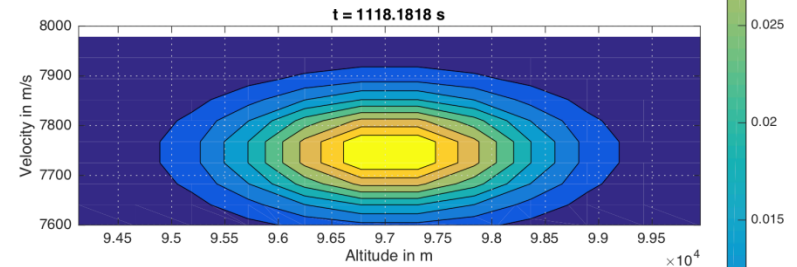
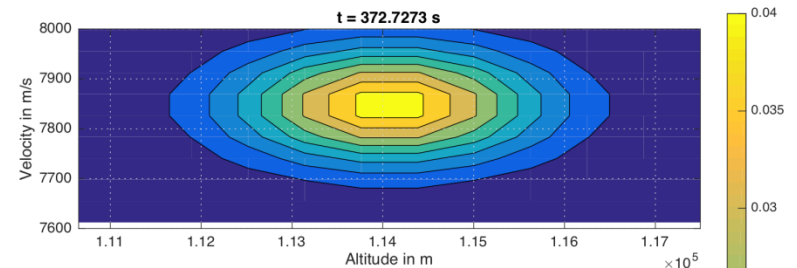
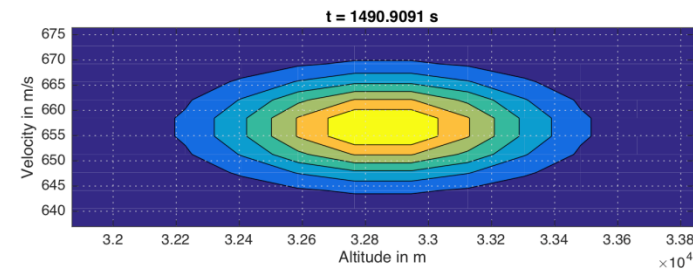
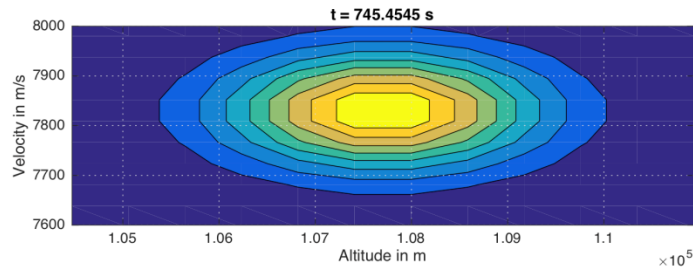
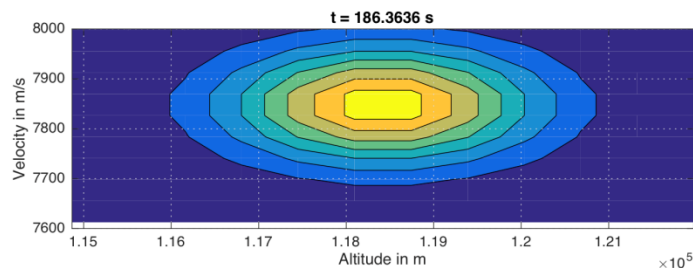


Uncertainty Dispersion of Space Debris Re-Entry

- Exemplary evolution of the two dimensional PDFs $\varphi(h, v)$
- The initial dispersions were chosen as:

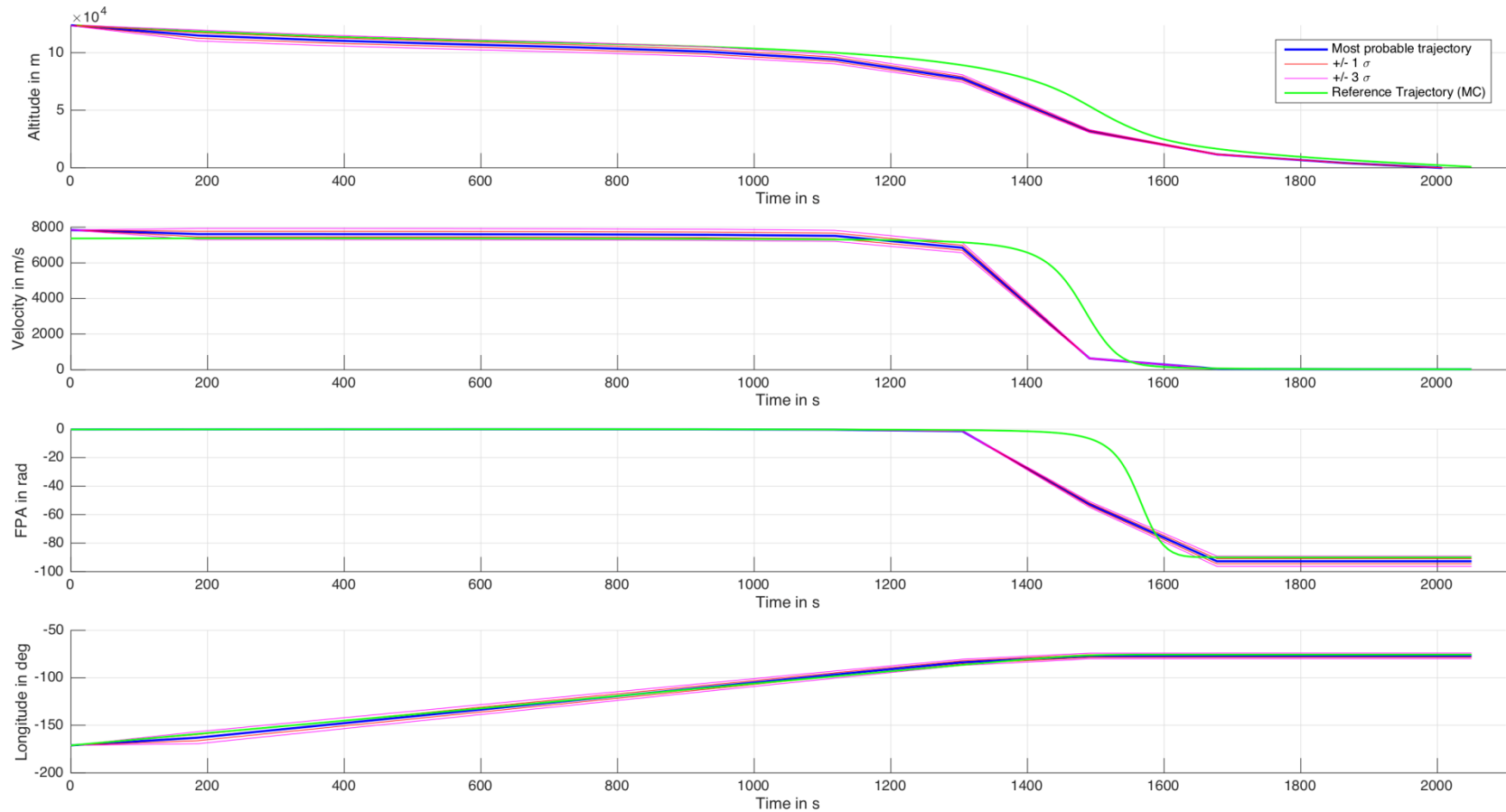
$$h_0 \quad \pm 100m \quad \gamma_0 \quad \pm 0.001^\circ$$

$$v_0 \quad \pm 0.1 \text{ m/s} \quad \theta_0 \quad \pm 0.001^\circ$$



Uncertainty Dispersion of Space Debris Re-Entry

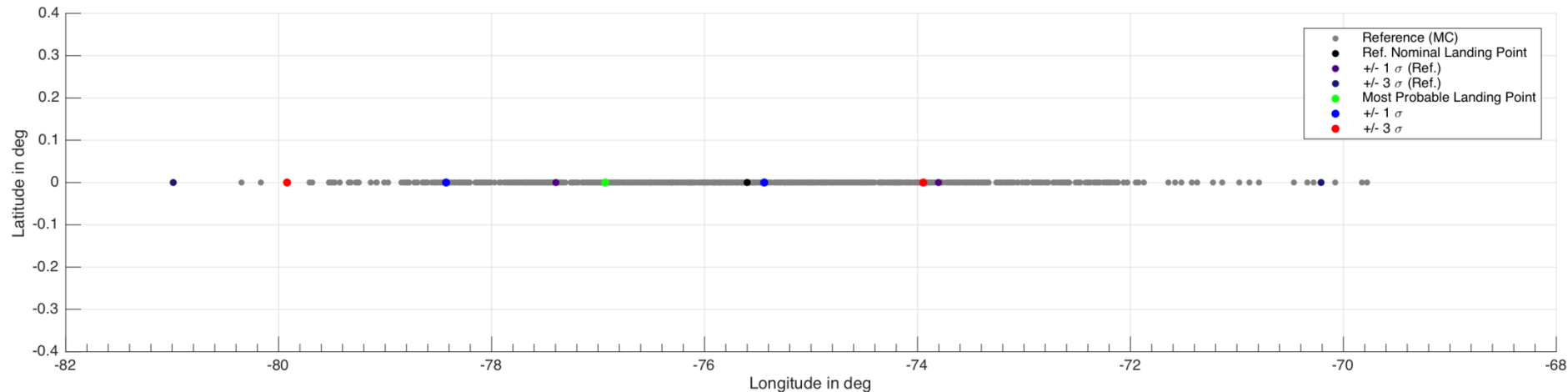
- Most probable trajectory generated from the PDFs in each time step in comparison with the reference trajectory



Uncertainty Dispersion of Space Debris Re-Entry

Landing Dispersion of Longitude in comparison with the landing dispersion of the reference run generated using the Monte-Carlo approach

	Results Stochastic Liouville Equation		Reference Monte- Carlo Analysis (GSOC)	
nominal	-76.93°		-75.6°	
σ	1.494		1.79	
$\pm 1\sigma$	-	-75.44°	-77.4°	-73.8°
$\pm 3\sigma$	-	-73.94°	-80.9°	-70.21°



Summary and Conclusion

- The Stochastic Liouville Equation presents a computational efficient alternative for the Monte-Carlo Analysis
- Derive landing dispersions and footprints directly from PDFs
- The presented method was part of my master thesis at the University of Bremen in collaboration with DLR Institute of Space Systems in Bremen
- The shown example and reference trajectory/ dispersion was developed by DLR Space Flight Technology and Astronaut Training/ German Space Operation Center (GSOC)
- Thanks to Dr. Marco Scharringhausen (DLR RY-LET) and Dr. Michael Kirschner (DLR RB-RFT)
- Any questions? Contact me via E-Mail: maren.huelsmann@dlr.de



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